```
In [1]: # Import pandas
         import pandas as pd
         # Using the datetime function
         import datetime
         # For generating word cloud
         import wordcloud
         from matplotlib import pyplot as plt
         # For Loading in the different categories
         import json
In [2]: # Reading the dataset into a dataframe df
         df = pd.read csv('USvideos.csv')
In [3]: df.shape
         # 16 Columns
         # 40,949 Rows
Out[3]: (40949, 16)
In [4]: df.head(1)
         # Before
Out[4]:
                video_id trending_date
                                           title channel_title category_id
                                                                                                     likes dislikes comment_count
                                                                         publish_time
                                                                                        tags views
                                      WE WANT
                                       TO TALK
                                                                                             748374 57527
         0 2kyS6SvSYSE
                             17.14.11
                                        ABOUT CaseyNeistat
                                                                                                             2966
                                                                                                                          15954 https:
                                                                  22 13T17:13:01.000Z
                                          OUR
                                     MARRIAGE
```

```
In [5]: # Wrangling Step 1
         # Changing it to the date format for better readability
         df["trending date"] = pd.to datetime( df["trending date"], format='%y.%d.%m' ).dt.date
        df.head(1)
In [6]:
         # After
Out[6]:
                                                                                                        likes dislikes comment count
                video id trending date
                                            title channel title category id
                                                                           publish time
                                                                                                views
                                                                                           tags
                                       WE WANT
                                        TO TALK
                                                                               2017-11- SHANtell
                                                                                                748374 57527
          0 2kyS6SvSYSE
                                                                                                                2966
                                                                                                                              15954 https:
                            2017-11-14
                                         ABOUT
                                                 CaseyNeistat
                                                                        13T17:13:01.000Z
                                                                                          martin
                                           OUR
                                      MARRIAGE
In [7]:
        # Wrangling Step 2
         # Slicing out publishing day and publishing hour from publish time
         # https://www.diaitalocean.com/community/tutorials/how-to-index-and-slice-strings-in-python-3
         df["publishing day"] = df["publish time"].apply(lambda x: datetime.datetime.strptime(x[:10], "%Y-%m-%d").date().strft:
         df["publishing hour"] = df["publish time"].apply(lambda x: x[11:13])
         df.head(1)
In [8]:
Out[8]:
                video_id trending_date
                                            title channel_title category_id
                                                                           publish time
                                                                                           tags
                                                                                                views
                                                                                                        likes dislikes comment count
                                       WE WANT
                                        TO TALK
         0 2kyS6SvSYSE
                                                                                                748374 57527
                            2017-11-14
                                         ABOUT
                                                CaseyNeistat
                                                                                                                2966
                                                                                                                              15954 https:
                                                                        13T17:13:01.000Z
                                           OUR
                                      MARRIAGE
```

```
In [9]: | # Wrangling Step 3
          # Convert it into a datetime object
          publish time = pd.to datetime(df.publish time, format='%Y-%m-%dT%H:%M:%S.%fZ')
          # Slicing out publish date and publish time only
          # dt.date - helps in retrieving the underlying date
          df['publish date'] = publish time.dt.date
          # dt.time helps in retrieving the underlying time
          df['publish time only'] = publish time.dt.time
          # Drop publish time
          df.drop('publish time',axis=1,inplace=True)
          # Just for better readability
          df['days to trending'] = (df.trending date - df.publish date).dt.days
In [10]:
         df.head(1)
Out[10]:
                                                                                      likes dislikes comment_count
                 video_id trending_date
                                           title channel_title category_id
                                                                          tags
                                                                               views
                                       WE WANT
                                        TO TALK
                                                                      SHANtell 748374 57527
          0 2kyS6SvSYSE
                                         ABOUT CaseyNeistat
                                                                                                           15954 https://i.ytimg.com/vi/2kyS
                            2017-11-14
                                                                                              2966
                                           OUR
                                      MARRIAGE
In [11]: # Wrangling Step 4
          # Setting Index
          #df.set index(['trending date','video id'],inplace=True)
In [12]: | #df.head(3)
```

```
# Cleaning Error 1:
In [13]:
          # Checking and Cleaning NaN values
          df[df["title"].apply(lambda x: pd.isna(x))].head(2)
In [14]:
Out[14]:
             video id trending date title channel title category id tags views likes dislikes comment count thumbnail link comments disabled rating
          df[df["channel title"].apply(lambda x: pd.isna(x))].head(2)
Out[15]:
             video_id trending_date title channel_title category_id tags views likes dislikes comment_count thumbnail_link comments_disabled rating
          df[df["views"].apply(lambda x: pd.isna(x))].head(2)
In [16]:
Out[16]:
             video id trending date title channel title category id tags views likes dislikes comment count thumbnail link comments disabled rating
In [17]:
          df[df["likes"].apply(lambda x: pd.isna(x))].head(2)
Out[17]:
             video id trending date title channel title category id tags views likes dislikes comment count thumbnail link comments disabled rating
          df[df["dislikes"].apply(lambda x: pd.isna(x))].head(2)
Out[18]:
             video_id trending_date title channel_title category_id tags views likes dislikes comment_count thumbnail_link comments_disabled rating
```

```
In [19]: df[df["comment count"].apply(lambda x: pd.isna(x))].head(2)
Out[19]:
             video_id trending_date title channel_title category_id tags views likes dislikes comment_count thumbnail_link comments_disabled rating
In [20]:
          # Displays the top 2 NaN values
           df[df["description"].apply(lambda x: pd.isna(x))].head(2)
Out[20]:
                     video_id trending_date
                                               title channel_title category_id
                                                                                                   views likes dislikes comment count
                                                                                             tags
                                            Dennis
                                             Smith
                                            Jr. and
                                                           Ben
           42 NZFhMSgbKKM
                                                                        17
                                                                                                                                    8 https://i.ytim
                                 2017-11-14
                                                                                                     945
                                                                                                            7
                                                                                                                     5
                                            LeBron
                                                                                           [none]
                                                       Rohrbach
                                            James
                                            go back
                                             and ...
                                           Stephon
                                           Marbury
                                                           NBA
                                               and
           47
                   sbcbvuitiTc
                                 2017-11-14
                                                     Highlights ·
                                                                        17 NBA|"Basketball"|"Sports" 956169 2017
                                                                                                                  2425
                                                                                                                                 1447
                                            Jimmer
                                                                                                                                           https:/
                                           Fredette
                                                       YouTube
                                            fight in
                                               C...
In [21]:
          # Cleaning Work - Filling the NaN values with blank spaces
           df["description"] = df["description"].fillna(value="")
```

```
In [22]: # Cleaning Error 2 :
          # Checking for videos which have an error or have been removed
          df[ df["video error or removed"] == True ].head(2)
Out[22]:
                       video id trending date
                                                     title channel title category id
                                                                                                             likes dislikes comment count
                                                                                              tags
                                                                                                     views
                                               Verizon 360
                                                 Live: The
                                                                                     live stream|"360
            2203 RK B4Ez4 5Q
                                   2017-11-25
                                                   Macy's
                                                               Verizon
                                                                                   video"|"fun videos 2618344 45197
                                                                                                                     2315
                                                                                                                                     3332 https://i.
                                             Thanksgiving
                                                                                         for kids"|...
                                                   Day ...
                                                                                       horror|"horror
                                                  Deleted
                                                              Midnight
                                                                               1 short"|"short"|"short
           15499
                    kZete48ZtsY
                                   2018-02-01
                                                                                                     60262
                                                                                                             4804
                                                                                                                      122
                                                                                                                                      736
                                                                                                                                            https:/
                                                                Video
                                                    video
                                                                                         film"|"my...
          # Cleaning Work :
In [23]:
          # Keeping only those videos which do not have any errors
          df = df[~df.video error or removed]
          df[ df["video error or removed"] == True ]
In [24]:
Out[24]:
             video_id trending_date title channel_title category_id tags views likes dislikes comment_count thumbnail_link comments_disabled rating
In [25]:
          df.shape
          # 23 rows eliminated
Out[25]: (40926, 20)
```

```
In [26]: # Cleaning Error 3 -
          # Checking for duplicate values of video id
          print( df["video id"].nunique() )
          # Clearly, total number of videos is not same as number of unique video ids
          # Need to manually remove distinct video ids
          6348
In [27]: # Cleaning Error 4 -
          # Checking the ratings disabled status
          df[ df["ratings disabled"] == True ].head(2)
Out[27]:
                                                         channel_title category_id
                                                                                            tags views likes dislikes comment_count
                      video id trending date
                                                title
                                            Breaking
                                               Bad's
                                                                                         Breaking
                                               Bryan
                                                                                       Bad|"Bryan
           1435 Kn5UgGQukYQ
                                                                                                  15058
                                                     hudsonunionsociety
                                                                                                                                  0 https://i.yti
                                 2017-11-21 Cranston
                                                                                 Cranston"|"malcom
                                                 on
                                                                                        in the m...
                                             Meeting
                                             Charl...
                                            Breaking
                                               Bad's
                                                                                         Breaking
                                               Bryan
                                                                                       Bad|"Bryan
           1667 Kn5UqGQukYQ
                                                                                                                                  0 https://i.yti
                                 2017-11-22 Cranston
                                                    hudsonunionsociety
                                                                                 Cranston"|"malcom
                                                                                        in the m...
                                             Meeting
                                             Charl...
In [28]: # Cleaning Work :
          # Keeping only those videos which do not have their ratings disabled
          df = df[~df.ratings disabled]
In [29]:
         df.shape
          # 169 rows eliminated
Out[29]: (40757, 20)
```

```
In [30]: df["title length"] = df["title"].apply(lambda x: len(x))
In [31]: df.head(1)
Out[31]:
                 video id trending date
                                           title channel title category id
                                                                              views
                                                                                      likes dislikes comment count ... comments disabled
                                                                          tags
                                       WE WANT
                                        TO TALK
                                                                      SHANtell 748374 57527
          0 2kyS6SvSYSE
                                         ABOUT CaseyNeistat
                                                                                              2966
                                                                                                           15954 ...
                            2017-11-14
                                                                                                                                False
                                           OUR
                                      MARRIAGE
          1 rows × 21 columns
In [32]: # Storing the different words from the video title in title words
          # split() - splits the string into a list, default separater is blank space
          # Here, every title is stored as a list
          title words = list(df["title"].apply(lambda x: x.split()))
In [33]: # Iterating through the list again
          # To store all the words in the form of a list
          # Here, the words of a title are further separated
          title words = [x for y in title words for x in y]
In [34]: #title words[1:3]
```

```
In [35]: # Generating word cloud

# https://stackoverflow.com/questions/43954114/python-wordcloud-repetitve-words

wc = wordcloud.WordCloud(background_color="white", width = 1200, height = 500, collocations = False, colormap="tab20b'

plt.figure(figsize=(15,10))

# https://matplotlib.org/3.2.1/gallery/images_contours_and_fields/interpolation_methods.html

plt.imshow(wc, interpolation='bilinear')

plt.axis("off")
```

Out[35]: (-0.5, 1199.5, 499.5, -0.5)



```
In [36]: # Counter counts the number of occurences of every word
         from collections import Counter
         Counter(title words)
Out[36]: Counter({'WE': 155,
                  'WANT': 7,
                  'TO': 537,
                   'TALK': 45,
                  'ABOUT': 16,
                   'OUR': 97,
                  'MARRIAGE': 19,
                  'The': 5734,
                  'Trump': 232,
                  'Presidency:': 7,
                  'Last': 307,
                  'Week': 220,
                  'Tonight': 59,
                  'with': 1617,
                  'John': 356,
                  'Oliver': 35,
                  '(HBO)': 56,
                   'Racist': 40,
```

'Superman': 29,

```
In [37]: # Adding Channel Categories
          # Opening the ison file
          # Storing the items in a list named different categories
          with open("C:/Users/Gayatri Aniruddha/Desktop/Sem 1 2020/Visualisation/Data Exploration Project/US category id.json")
              different categories = json.load(cat)["items"]
          # Creating an empty dictionary
          category dict = {}
          # Extracting the id and title from the categories
          for each in different categories:
              category dict[int(each["id"])] = each["snippet"]["title"]
          # Creating a new column called category name
          df['category name'] = df['category id'].map(category dict)
         df.head(1)
In [38]:
Out[38]:
                 video_id trending date
                                            title channel_title category_id
                                                                                       likes dislikes comment_count ... ratings_disabled vi
                                                                                views
                                                                          tags
                                       WE WANT
                                        TO TALK
          0 2kyS6SvSYSE
                                         ABOUT
                                                 CaseyNeistat
                                                                               748374 57527
                                                                                               2966
                                                                                                            15954 ...
                                                                                                                               False
                            2017-11-14
                                                                         martin
                                           OUR
                                      MARRIAGE
         1 rows × 22 columns
```

df.to csv(r'C:\Users\Gayatri Aniruddha\Desktop\Sem 1 2020\Visualisation\Data Exploration Project\Trial 4.csv')

In [40]: